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(54) **LEARNING HIGHLIGHTS USING EVENT DETECTION**

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G06N 20/00 (2019.01); G06K 2009/00738
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(58) **Field of Classification Search**

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See application file for complete search history.

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(*) Notice: Subject to any disclaimer, the term of this
patent is extended or adjusted under 35
U.S.C. 154(b) by 133 days.

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Related U.S. Application Data

(63) Continuation of application No. 14/585,075, filed on
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(57) **ABSTRACT**

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A highlight learning technique is provided to detect and
identify highlights in sports videos. A set of event models are
calculated from low-level frame information of the sports
videos to identify recurring events within the videos. The
event models are used to characterize videos by detecting
events within the videos and using the detected events to
generate an event vector. The event vector is used to train a
classifier to identify the videos as highlight or non-highlight.

(52) **U.S. Cl.**
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21 Claims, 5 Drawing Sheets

